## Graph

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## Graph representation

Adjacency-list representation Adjacency-matrix representation Weighted graphs

## Searching a graph

Breadth-first search Depth-first search

Topological sorting

Graph representation and elementary algorithms

Data Structures and Algorithms

Tran Ngoc Bao Duy

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## Overview

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3 Topological sorting BOI HCMUT-CNCP



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### Graph

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## **Graph representation**

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Two standard ways to represent a graph G=(V,E) apply

to both directed and undirected graphs:

1 Adjacency-list: provides a compact way to represent sparse graph  $(|E| \ll |V|^2)$ .

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## **Graph representation**

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## Two standard ways to represent a graph G = (V, E) apply to both directed and undirected graphs:

- **1 Adjacency-list:** provides a compact way to represent sparse graph  $(|E| \ll |V|^2)$ .
- **2** Adjacency-matrix: preferred when the graph is dense  $(|E| \approx |V|^2)$  or when need to tell quickly if there is an edge connecting two given vertices.

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## **Definition**

The adjacency-list representation of a graph G = (V, E):

• Consists of an array Adj of |V| lists, one for each vertex in V.

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- For each  $u \in V$  , the adjacency list Adj[u] contains all the vertices such that there is an edge  $(u,v) \in E$  or all the vertices adjacent to u in G.

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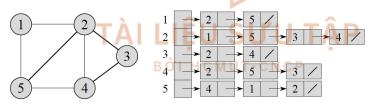
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(Source: Introduction to algorithms - 3rd edition)

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## **Adjacency-list: Properties**

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- 1 If G is a **directed** graph, the sum of the lengths of all the adjacency lists is |E|.
- 2 If G is a **undirected** graph, the sum of the lengths of all the adjacency lists is 2|E|.
- 3 The amount of memory required for both cases of graph is  $\Theta(V+E)$ .

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## **Adjacency-list: Properties**

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- 1 If G is a **directed** graph, the sum of the lengths of all the adjacency lists is |E|.
- 2 If G is a **undirected** graph, the sum of the lengths of all the adjacency lists is 2|E|.
- 3 The amount of memory required for both cases of graph is  $\Theta(V+E)$ .

Disadvantages: provides no quicker way to determine whether a given edge (u,v) is present in the graph than to search for in the adjacency list Adj[u].

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## Definition

Assume that the vertices are numbered  $1,2,\ldots,|V|$  in some arbitrary manner, the **adjacency-matrix representation** of a graph G=(V,E) consists of a  $|V|\times |V|$  matrix  $A=(a_{ij})$  such that

$$a_{ij} = egin{cases} 1 & ext{if } (i,j) \in E \ 0 & ext{otherwise} \end{cases}$$

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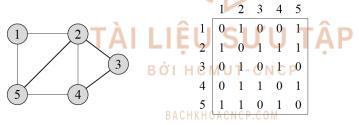
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## **Adjacency-matrix: Properties**

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## Searching a graph

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1 Requires  $\Theta(V^2)$  memory, independent of the number of edges in the graph.

2 Along the main diagonal of the adjacency matrix, there is a symmetry such that the adjacency matrix A of an undirected graph is its own transpose:  $A = A^T$ .

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## Weighted graphs

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To represent **weighted graphs**, that is, graphs for which each edge has an associated **weight**, typically given by a weight function  $w: E \to \mathbb{R}$ .

- Adjacency-list: store the weight w(u, v) of the edge  $(u, v) \in E$  with vertex v in u's adjacency list.
- Adjacency-matrix: store the weight w(u,v) of the edge  $(u,v)\in E$  as the entry in row u and column v of the adjacency matrix. If an edge does not exist, it stores NIL, 0 or  $\infty$  up to your convenience.

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## Graph representation

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## **Comparision**

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- 1 Adjacency-list: requires less memory, required simply by most of the graph algorithms.
- 2 Adjacency-matrix: simpler and preferred when graphs are reasonably small, requires only one bit per entry.

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## Searching a graph

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**Searching a graph** means systematically following the edges of the graph so as to visit the vertices of the graph.

 A graph-searching algorithm can discover much about the structure of a graph.



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## Searching a graph

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- A graph-searching algorithm can discover much about the structure of a graph.
- Many algorithms begin by searching their input graph to obtain this structural information.

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## Searching a graph

HOACN

**Searching a graph** means systematically following the edges of the graph so as to visit the vertices of the graph.

- A graph-searching algorithm can discover much about the structure of a graph.
- Many algorithms begin by searching their input graph to obtain this structural information.
- Techniques for searching a graph lie at the heart of the field of graph algorithms.

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## Definition

- Given a graph G=(V,E) and a distinguished source vertex s, breadth-first search systematically explores the edges of G to discover every vertex that is reachable from s by computing the distance (smallest number of edges) from s to each reachable vertex.
- It also produces a breadth-first tree with root s that contains all reachable vertices.

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## Properties:

1 For any vertex reachable from s, the simple path in the breadth-first tree from s to corresponds to a *shortest* path from s to in G, that is, a path containing the smallest number of edges.

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## Properties:

- 1 For any vertex reachable from s, the simple path in the breadth-first tree from s to corresponds to a *shortest* path from s to in G, that is, a path containing the smallest number of edges.
- Works on both directed and undirected graphs.

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## Graph representation

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## Searching a graph Breadth-first search

Depth-first search

## Breadth-first search: Pseudocode

```
BFS(G,s)
    for each vertex u \in G. V - \{s\}
         u.color = WHITE
         u.d = \infty
         u.\pi = NIL
    s.color = GRAY
    s.d = 0
    s.\pi = NIL
     O = \emptyset
    ENQUEUE(Q, s)
    while Q \neq \emptyset
10
11
         u = \text{DEQUEUE}(Q)
12
         for each v \in G.Adj[u]
             if v.color == WHITE
13
                  v.color = GRAY
14
15
                  v.d = u.d + d + d + CMUT - CNCP
16
                  v.\pi = u
17
                  ENQUEUE(Q, \nu)
18
         u.color = BLACK
```

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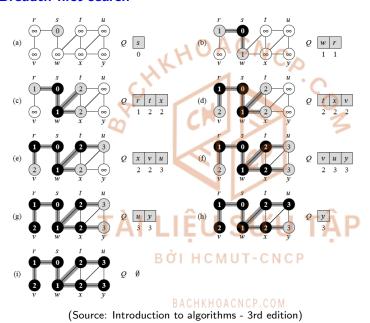


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## Searching a graph

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## Shortest path between two vertices

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## Searching a graph

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Topological sorting

```
procedure prints out the vertices on a shortest path from s to v:

PRINT-PATH(G, s, v)

1 if v = s

2 print s

3 elseif v.\pi = nIL

4 print "no path from" s "to" v "exists"

5 else PRINT-PATH(G, s, v.\pi)

6 print v
```

Assuming that BFS has already computed, the following

**Depth-first search** is the strategy to search *deeper* in the graph whenever possible.

1 Explores edges out of the most recently discovered vertex v that still has unexplored edges leaving it.



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#### Searching a graph

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Depth-first search

**Depth-first search** is the strategy to search *deeper* in the graph whenever possible.

- 1 Explores edges out of the most recently discovered vertex v that still has unexplored edges leaving it.
- 2 Once all of v's edges have been explored, the search backtracks to explore edges leaving the vertex from which v was discovered.

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- 3 Continues until all the vertices that are reachable from the original source vertex discovered.

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- 3 Continues until all the vertices that are reachable from the original source vertex discovered.
- 4 If any undiscovered vertices remain, then depth-first search selects one of them as a new source, and it repeats the search from that source.

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- 4 If any undiscovered vertices remain, then depth-first search selects one of them as a new source, and it repeats the search from that source.
- **6** The algorithm repeats this entire process until it has discovered every vertex.

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       u.color = WHITE
       u.\pi = NII.
   time = 0
   for each vertex u \in G.V
       if u.color == WHITE
6
            DFS-VISIT(G, u)
DFS-VISIT(G, u)
                                  // white vertex u has just been discovered
    time = time + 1
    u.d = time
    u.color = GRAY
                                  // explore edge (u, v)
    for each v \in G.Adi[u]
        if v.color == WHITE
 6
             v.\pi = u
             DFS-VISIT(G, \nu)
    u.color = BLACK
    time = time + 1
10
    u.f = time
```

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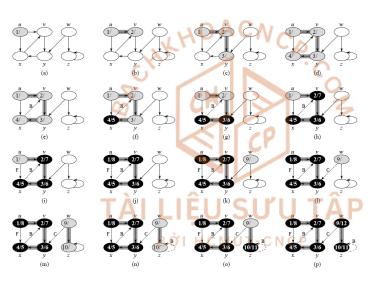
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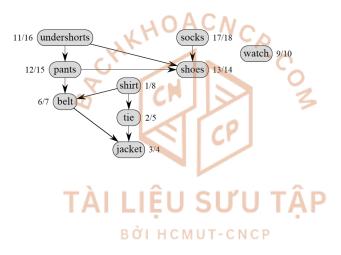
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## **Bumstead dressing**



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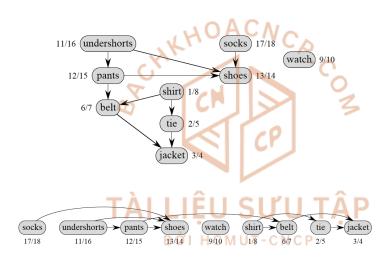
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## **Topological sorting**

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## **Definition**

A topological sort of a directed acyclic graph G=(V,E) is a linear ordering of all its vertices such that if G contains an edge (u,v) then u appears before in the ordering. If the graph contains a cycle, then no linear ordering is possible.

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## TOPOLOGICAL-SORT(G)

- 1 call DFS(G) to compute finishing times  $\nu$ . f for each vertex  $\nu$
- 2 as each vertex is finished, insert it onto the front of a linked list
- 3 **return** the linked list of vertices

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## **Applications**

A common application of topological sorting is in scheduling a sequence of jobs.

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## **Applications**

- A common application of topological sorting is in scheduling a sequence of jobs.
- The jobs are represented by vertices, and there is an edge from x toy if job x must be completed before job y can be started

For example, in constructing a building, the basement must be completed before the first floor, which must be completed before the second floor and so on.

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- The jobs are represented by vertices, and there is an edge from x toy if job x must be completed before job y can be started
  - For example, in constructing a building, the basement must be completed before the first floor, which must be completed before the second floor and so on.
- A topological sort gives an order in which we should perform the jobs.



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